Meta-Tracing, RPython, and PyPy



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Motivation

An Alternate Approach to VM Construction

- Most productions VMs are written by hand in C/C++
- VMs are very tedious and costly to write
- Particularly for complex dynamically typed languages







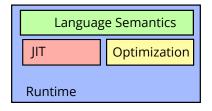






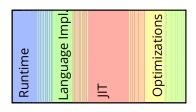
Domain: Language Virtual Machines

- Important goal of VM construction is performance
- A good JIT is needed
- Particularly for dynamically typed languages, where nothing is known statically



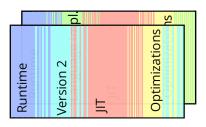
Problem: VMs have Monolithic Architecture

- JITs are complex engineering artifacts
- Architecture is often very complicated, with different concerns tangled up
- Changing the language is a lot of effort
- Very hard to share infrastructure between VMs for different languages



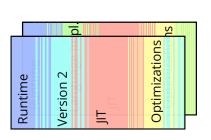
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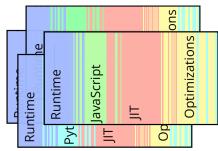
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Approach: Separation of Concerns

Separate the following VM implementation concerns:

- Language semantics
- Generic JIT compilation issues
- Generic optimizations
- Language-specific optimizations

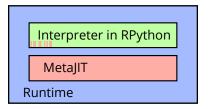
The RPython Project and PyPy 🤝

- RPython is a language to implement interpreters
- Interpreters are translated into C-based VMs
- Various extra features are added, e.g. GC
- Most mature interpreter is PyPy: Python in RPython
- Long-running project, many contributors

Interpreter in RPython
Runtime

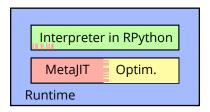
A Meta-Tracing JIT for RPython

- Apply the meta-tracing approach to RPython
- Insert meta JIT into the generated VM
- Contains generic JIT infrastructure: backends, integration, GC
- Needs some hints from the interpreter author
- Hints specify the main dispatch loop and the program counter



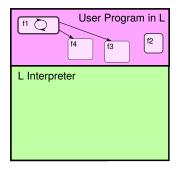
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- Contains generic JIT infrastructure: backends, integration, GC
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- Hints specify the main dispatch loop and the program counter
- Typical optimizations, plus some specific ones

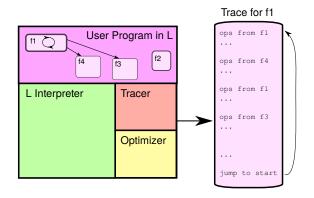


Meta-Tracing

- Dream: add a simple JIT component to an interpreter
- Starts out interpreting and focuses on loops.
- Tracer records activity of interpreter for important loops.
- Conditions are turned into guards.



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User program (lang FL)

```
if x < 0:
    x = x + 1
else:
    x = x + 2
x = x + 3</pre>
```

User program (lang FL) Trace when x is set to 6

```
if x < 0:
    x = x + 1
else:
    x = x + 2
x = x + 3</pre>
```

```
guard_type(x, int)
guard_type(0, int)
guard_not_less_than(x, 0)
guard_type(x, int)
guard_type(2, int)
x = int_add(x, 2)
guard_type(x, int)
guard_type(3, int)
x = int_add(x, 3)
```

User program (lang FL)

Optimised trace

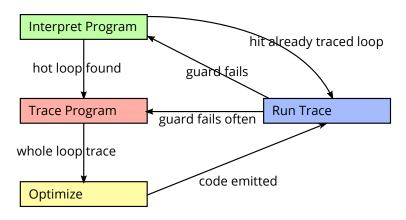
```
if x < 0:
    x = x + 1
else:
    x = x + 2
x = x + 3</pre>
```

```
guard_type(x, int)
guard_not_less_than(x, 0)
x = int_add(x, 5)
```

Guards

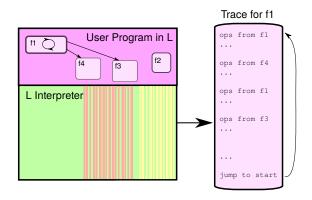
- Conditions are turned into guards.
- They check that the same control flow is followed.
- When they fail, go back to interpretation.
- Side traces are attached to commonly failing guards.
- Tracing works best if subsequent iterations of a loop follow the same control flow.

State Transitions Tracing JIT



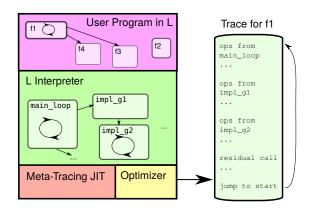
In Practice

- Components end up tangled and messy
- Many versions not solved
- Still need to start from scratch for every language



Meta-Tracing

- Solution: Trace the interpreter, not the program.
- Interpreters are big loops with complex control flow.



Adding a JIT to an RPython interpreter

```
pc = 0
while 1:
    instr = load_next_instruction(pc)
    if instr == POP:
        stack.pop()
        pc += 1
    elif instr == BRANCH:
        off = load_branch_jump(pc)
        pc += off
    elif ...:
```

Observation: interpreters are big loops.

Adding a JIT to an RPython interpreter

```
pc = 0
while 1:
    jit_merge_point(pc)
    instr = load_next_instruction(pc)
    if instr == POP:
        stack.pop()
        pc += 1
    elif instr == BRANCH:
        off = load branch jump (pc)
        if off < 0: can enter jit(pc)
        pc += off
    elif ...:
```

Observation: interpreters are big loops.

Meta-Tracing

- A lot of the interpreter data structure manipulations are optimized away.
- Examples: Stack manipulation etc.
- Some technical challenges, but separation works well.

Generic Optimizations

- Typical compiler optimizations
- Easy to implement, because of traces

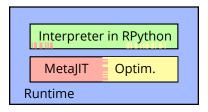
Generic Optimizations

- Typical compiler optimizations
- Easy to implement, because of traces
- Interesting new one: allocation removal
- Dynamic languages allocate a lot of objects, e.g. for primitive boxes
- Objects often have limited predetermined lifetime
- a + b * c
- Remove intermediate allocations in traces

Runtime Feedback

Language-Specific Runtime Feedback

- JIT gets its power by observing the running program
- Bare meta-tracing does not know any details of the language implemented
- Language implementer can provide extra information with more hints
- These often express how the language is typically used
- Such information is only implicit or absent from the interpreter source



Example: Language-Specific Runtime Feedback

At a method callsite, the called method is often always the same:

```
def lookup(cls, methname):
    ...

def send(obj, messagename, arguments):
    cls = obj.getclass()

    meth = lookup(cls, messagename)
    return meth.call(obj, arguments)
```

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def lookup(cls, methname):
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```

Case Studies

PyPy, an RPython VM for Python 🤝

- How the RPython project got started.
- Very compatible and fast implementation of Python 2.7.
- Big developer community with various interests.
- Around 60K LoC (interpreter) and 190K LoC (modules) of RPython code.

Hints in PyPy

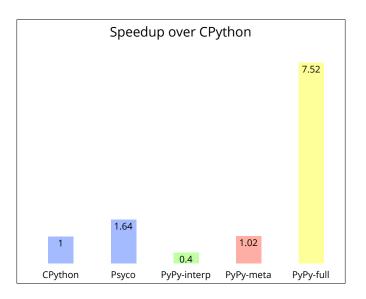
- About 400 hints in the interpreter.
- Continuous process to add more.
- Mostly concerned with core features of the language.
 - Global lookups
 - Method calls
 - Attribute reads
 - Data structures (e.g. lists and sets)

Example: Attribute Reads in Python

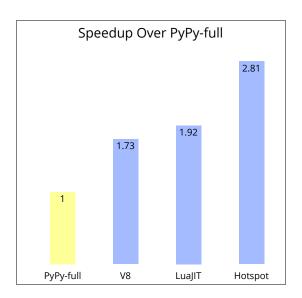
What happens when an attribute x . m is read? (simplified)

- ullet check for the presence of ${\tt x._getattribute__}$, if there, call it
- look for the name of the attribute in the object's dictionary, if it's there, return it
- walk up the MRO of the object and look in each class' dictionary for the attribute
- if the attribute is found, call its ___get___ attribute and return the result
- if the attribute is not found, look for x.__getattr___, if there, call it
- raise an AttributeError

Python Benchmarks



Shootout Benchmarks

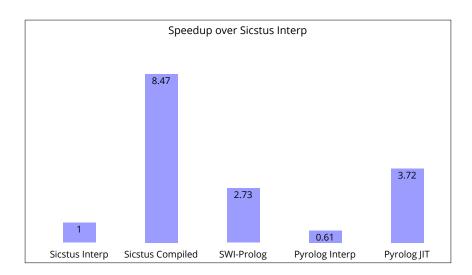


<u>D</u>emo

Pyrolog

- A Prolog interpreter in RPython
- Very different execution model than Python
- Still decent performance improvements
- About 15K LoC of RPython code
- 70 hints

Prolog Benchmarks



Summary

- Using the RPython JIT, most of the JIT infrastructure is shared between languages
- Only an interpreter and some hints are needed
- Can support languages as different as Prolog and Python
- Other languages: PHP, Ruby, Smalltalk, Racket, SQLite, CPU emulators, ...
- "Gives you 80% of a great JIT 20% of the effort"

